#### Liquidity in dealer markets

#### Peter Bank



#### joint work in progress with Ibrahim Ekren and Johannes Muhle-Karbe

METE - Mathematics and Economics: Trends and Explorations. A conference celebrating METE SONER's 60th birthday and his contributions to Analysis, Control, Finance and Probability

ETH Zürich, June 4-8, 2018

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# Financial markets with frictions: Mete'a ons.html





Theorem

### Mete LOVES frictions.

q.e.d.

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#### Frictions in financial modelling

- Classical Black-Scholes theory: dynamic trading of arbitrary amounts, arbitrarily fast without affect on exogenously given asset prices and without taxes, transaction fees, etc.
- How to account for these nonlinear effects? Formidable challenges at the interfaces between financial modelling, stochastic analysis, and stochastic optimal control
- "Equilibrium models" versus cost specifications
- Illiquidity due to differences in information (Glosten-Milgrom '85, Kyle '85) and/or due to inventory risk (Ho-Stoll '81, Grossman-Miller '88): <= 3 period models</li>
- Dynamic equilibrium type models: Back '90, Garleanu-Pedersen-Poteshman '09, Kramkov-Pulido '16, B.-Kramkov '15
- Cost specifications: Soner-Shreve '94, Almgren-Chriss '01, Obizhaeva-Wang '13, Roch-Soner '13

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#### Dramatis personae

An FX desk's business as a *ménage a trois*...:

- Dealers: compete quoting FX rates, supply currency to their clients; transfer inventory to end-users at a finite rate at fundamental exchange rate, thereby incurring search costs and inventory risk
- Clients: demand currency positions from their dealers, get served at their competitive rates
- "End-users": accept positions at fundamental FX rates, can only be contacted at search cost incurred by dealers

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Questions:

- How do the dealers' prices (FX rates) match demand with supply? How are they related to fundamentals? What role is played by the dealers' search costs and inventory risk aversion?
- How should clients choose their demand to manage their exogenously given risk? What if they internalize their impact? Do they benefit from the dealers' presence?
- Who are the end-users?

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#### The dealers' problem

For FX quotes  $(S_t)$  and fundamental FX rates  $(V_t)$ , the dealers servicing their clients' requested positions  $(K_t)$  and cumulatively transferring  $U_t = \int_0^t u_s \, ds$  to the end-users at costs  $\frac{\lambda}{2} u_t^2 dt$  in  $t \in [0, T]$ , will generate proceeds

$$\int_0^T (-K_t) dS_t - (V_T - S_T) K_T + \int_0^T U_t dV_t - \frac{\lambda}{2} \int_0^T u_t^2 dt.$$

Assuming V is a martingale, i.e., ruling out speculation on FX rates trends etc., we get the **dealers' expected proceeds** to be

$$\mathbb{E}\left[\int_0^T (-\kappa_t) dS_t - (V_T - S_T) \kappa_T - \frac{\lambda}{2} \int_0^T u_t^2 dt\right].$$

The **dealers' inventory risk** is determined by U - K:

$$\frac{1}{2}\mathbb{E}\left[\int_0^T (K_t - U_t)^2 \, dt\right]$$

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#### The dealers' problem

Dealers' target functional with risk aversion  $\gamma_d > 0$ :

$$J_d(K, u; S) \triangleq \mathbb{E}\left[\int_0^T (-K_t) dS_t - (V_T - S_T) K_T - \frac{\lambda}{2} \int_0^T u_t^2 dt\right] \\ - \frac{\gamma_d}{2} \mathbb{E}\left[\int_0^T (K_t - U_t)^2 dt\right] \to \max_{K, u}$$

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Observe: Problem can be addressed in two stages.

**Stage 1:** *Given K*, maximization over *u* is a quadratic tracking problem

$$\mathbb{E}\left[\frac{\gamma_d}{2}\int_0^T (K_t - U_t)^2 dt + \frac{\lambda}{2}\int_0^T u_t^2 dt\right] \to \min_u$$

as solved explicitly in **Soner** et al. '17. **Stage 2:** *Given* the optimal transfer policy  $u^{K}$  for any K, optimize over K.

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#### Quadratic tracking problem

Theorem (Soner et al. '17)

The dealers' optimal trading rate minimizing

$$\mathbb{E}\left[\frac{\gamma_d}{2}\int_0^T (K_t - U_t)^2 dt + \frac{\lambda}{2}\int_0^T u_t^2 dt\right]$$

is

$$u_t^K \triangleq rac{d}{dt} U_t^K = rac{ anh((T-t)/\sqrt{\kappa})}{\sqrt{\kappa}} (\hat{K}_t - U_t^K)$$

where

$$\kappa \triangleq \lambda/\gamma_d \text{ and } \hat{K}_t \triangleq \mathbb{E}\left[\int_t^T K_u \frac{\cosh((T-u)/\sqrt{\kappa})}{\sqrt{\kappa}\sinh((T-t)/\sqrt{\kappa})} du \middle| \mathscr{F}_t
ight]$$

 $\rightarrow$  Dealers form a view  $\hat{K}$  on expected future demand and trade with the end-users towards this ideal position. Peter Bank (TU Berlin)

#### Quadratic tracking problem with terminal constraint

#### Theorem (Soner et al. '17)

The dealers' optimal trading rate minimizing

$$\mathbb{E}\left[\frac{\gamma_d}{2}\int_0^T (K_t - U_t)^2 \, dt + \frac{\lambda}{2}\int_0^T u_t^2 \, dt\right]$$

subject to  $U_T = K_T$  is

$$u_t^K \triangleq rac{d}{dt} U_t^K = rac{ ext{coth}((T-t)/\sqrt{\kappa})}{\sqrt{\kappa}} (\hat{K}_t - U_t^K)$$

where, as before,  $\kappa \triangleq \lambda/\gamma_d$ , but now

$$\begin{split} \hat{\mathcal{K}}_{t} = & \frac{1}{\cosh(\frac{T-t}{\sqrt{\kappa}})} \mathbb{E}\left[\mathcal{K}_{T} \mid \mathscr{F}_{t}\right] \\ &+ \left(1 - \frac{1}{\cosh(\frac{T-t}{\sqrt{\kappa}})}\right) \mathbb{E}\left[\int_{t}^{T} \mathcal{K}_{s} \frac{\sinh(\frac{T-s}{\sqrt{\kappa}})}{(\cosh(\frac{T-t}{\sqrt{\kappa}}) - 1)\sqrt{\kappa}} \middle| \mathscr{F}_{t}\right]. \end{split}$$
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$$\begin{array}{c} 9 \neq 20 \end{array}$$



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**Figure:** Demand K with a jump at t = T/2 (blue), dealers' unconstrained (orange, dashed) and constrained (green, dashed) target  $\hat{K}$ 



















## More on quadratic tracking problem with terminal constraint

Corollary (Soner et al. '17) A terminal position  $K_T \in L^2(\Omega, \mathscr{F}, \mathbb{P})$  can be attained at finite expected costs, i.e.,

$$K_T = U_T = \int_0^T u_t \, dt$$
 for some progressive  $u$  with  $\mathbb{E} \int_0^T u_t^2 dt < \infty$ 

if and only if

## More on quadratic tracking problem with terminal constraint

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 for some progressive  $u$  with  $\mathbb{E} \int_0^T u_t^2 dt < \infty$ 

if and only if  $K_T$  becomes known sufficiently fast towards the end in the sense that

$$\int_0^T \frac{\mathbb{E}[(K_T - \mathbb{E}\left[K_T \mid \mathscr{F}_t\right])^2]}{(T-t)^2} dt < \infty.$$

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**Stage 2:** Dealers' target functional with risk aversion  $\gamma_d > 0$ :  $J_d(K; S) \triangleq \mathbb{E}\left[\int_0^T (-K_t) dS_t - (V_T - S_T) K_T\right]$   $- \mathbb{E}\left[\frac{\gamma_d}{2} \int_0^T (K_t - U_t^K)^2 dt + \frac{\lambda}{2} \int_0^T (u_t^K)^2 dt\right] \to \max_K$ 

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FX quotes  $(S_t)$  will generate an **equilibrium** if at these quotes the dealers' optimal supply matches their clients' demand  $\mathcal{K}$ :

 $\mathscr{K} \in \operatorname*{arg\,max}_{K} J(K; S)$ 

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#### Theorem

Given clients' demand  ${\mathscr K}$  , the unique equilibrium quotes  $S^{{\mathscr K}}$  are

$$S_t^{\mathscr{K}} \triangleq V_t + \gamma_d \mathbb{E}\left[\int_t^T (\mathscr{K}_s - U_s^{\mathscr{K}}) ds \,\middle|\, \mathscr{F}_t\right], \quad 0 \leq t \leq T,$$

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where  $U^{\mathscr{K}}$  describes the dealers' optimal cumulative transfers to the end-users as determined by **Soner** et al. '17

$$S_t^{\mathscr{K}} = V_t + \gamma_d \mathbb{E}\left[\int_t^T (\mathscr{K}_s - U_s^{\mathscr{K}}) ds \,\middle|\, \mathscr{F}_t\right], \quad 0 \leq t \leq T,$$

- ▶ fundamental value V adjusted for dealers' effective risk
- adjustment in line with asymptotic expansion for small dealer risk aversion in exponential utility setting by Kramkov-Pulido '16 (who do not consider end-users)
- small search costs asymptotics of dealers' surcharge depend on demand regularity:
  - absolutely continuous demand  $\mathscr{K} = \int_0^{\cdot} \mu_t^{\mathscr{K}} dt$ :

$$\int_0^T \mathcal{K}_t d(V_t - S_t^{\mathscr{K}}) = \lambda \int_0^T (\mu_t^{\mathscr{K}})^2 dt + o(\lambda) \text{ in } L^1 \text{ as } \lambda \downarrow 0$$

• diffusive demand  $\mathscr{K} = \int_0^{\cdot} (\mu_t^{\mathscr{K}} dt + \sigma_t^{\mathscr{K}} dW_t)$ :

$$\int_0^T \mathscr{K}_t d(V_t - S_t^{\mathscr{K}}) = \sqrt{\lambda \gamma_d} \int_0^T (\sigma_t^{\mathscr{K}})^2 dt + o(\sqrt{\lambda}) \text{ in } L^1 \text{ as } \lambda \downarrow 0$$

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endogenous price impact model with resilience, in contrast to
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#### The clients' problem

How should the clients choose their demand  $\mathcal{K}$  given quotes  $(S_t)$ ?

#### The clients' problem

How should the clients choose their demand  $\mathscr{K}$  given quotes  $(S_t)$ ? **Quadratic criterion:** Facing exogenous FX exposure  $(\zeta_t)$ , the clients seek to maximize

$$J_{c}(\mathscr{K}; S) \triangleq \mathbb{E}\left[\int_{0}^{T} \mathscr{K}_{t} \, dS_{t}\right] - \frac{\gamma_{c}}{2} \mathbb{E}\left[\int_{0}^{T} (\zeta_{t} - \mathscr{K}_{t})^{2} dt\right] \to \max_{\mathscr{K}}$$

If  $(S_t)$  has drift  $(\mu_t)$ , this amounts to

$$\mathbb{E}\left[\int_0^T \left(\mathscr{K}_t \mu_t - \frac{\gamma_c}{2}(\zeta_t - \mathscr{K}_t)^2\right) dt\right] \to \max_{\mathscr{K}}, \text{ i.e. } \mathscr{K}_t^* = \zeta_t - \mu_t / \gamma_c$$

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If  $(S_{t})$  has drift  $(\mu_{t})$ , this amounts to  
$$\mathbb{E}\left[\int_{0}^{T} \left(\mathcal{H}_{t}\mu_{t} - \frac{\gamma_{c}}{2}(\zeta_{t} - \mathcal{H}_{t})^{2}\right) dt\right] \to \max_{\mathcal{H}}, \text{ i.e. } \mathcal{H}_{t}^{*} = \zeta_{t} - \mu_{t}/\gamma_{c}$$
  
Given demand  $\mathcal{H}^{*}$ , the equilibrium quotes'  $S^{\mathcal{H}^{*}}$  drift is  
 $\mu_{t}^{\mathcal{H}^{*}} = -\gamma_{d}(\mathcal{H}_{t}^{*} - U_{t}^{\mathcal{H}^{*}})$ 

which yields the equilibrium demand equation:

$$\mathscr{K}_t^* = \frac{\gamma_d}{\gamma_d + \gamma_c} U_t^{\mathscr{K}^*} + \frac{\gamma_c}{\gamma_d + \gamma_c} \zeta_t, \quad t \in [0, T],$$

where, again,  $U^{\mathcal{K}^*}$  is as in **Soner** et al. '17. Peter Bank (TU Berlin)

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is an integral equation for  $\mathscr{K}^*$ . With

$$k_t \triangleq \mathscr{K}_t^* - \frac{\gamma_c}{\gamma_d + \gamma_c} \zeta_t \text{ and } K_t \triangleq \mathbb{E}\left[\int_t^T \mathscr{K}_u^* \frac{\cosh((T-u)/\sqrt{\kappa})}{\sqrt{\kappa}\cosh((T-t)/\sqrt{\kappa})} du\right] \mathscr{F}_t$$

it is equivalent to the *linear forward backward stochastic differential equation* (FBSDE):

$$k_{0} = 0, \ dk_{t} = \left(\frac{\gamma_{d}}{\gamma_{d} + \gamma_{c}}K_{t} - \frac{\tanh((T - t)/\sqrt{\kappa})}{\sqrt{\kappa}}k_{t}\right)dt,$$
  

$$K_{T} = 0, \ dK_{t} = \left(\frac{\tanh((T - t)/\sqrt{\kappa})}{\sqrt{\kappa}}K_{t} - \frac{1}{\kappa}(k_{t} + \frac{\gamma_{c}}{\gamma_{d} + \gamma_{c}}\zeta_{t})\right)dt + dM_{t}^{K}$$

for a suitable martingale  $M^K$  determined uniquely by the FBSDE. Peter Bank (TU Berlin) 15 / 20

#### Equilibrium demand

#### Theorem

The unique equilibrium demand is given explicitly by

$$\mathscr{K}_{t}^{*} = \frac{\gamma_{c}}{\gamma_{d} + \gamma_{c}} \zeta_{t} + \tilde{U}_{t}^{\frac{\gamma_{d}}{\gamma_{d} + \gamma_{c}}\zeta}, \quad t \in [0, T]$$

where  $\tilde{U}^{\frac{\gamma_d}{\gamma_d+\gamma_c}\zeta}$  denotes the tracking portfolio from **Soner** et al.:

$$\frac{d}{dt}\tilde{U}_t^{\frac{\gamma_d}{\gamma_d+\gamma_c}\zeta} = \frac{\tanh((T-t)/\sqrt{\tilde{\kappa}})}{\sqrt{\tilde{\kappa}}} \left(\frac{\gamma_d}{\gamma_d+\gamma_c}\zeta_t - \tilde{U}_t^{\frac{\gamma_d}{\gamma_d+\gamma_c}\zeta}\right),$$

for the aggregate risk tolerance  $1/\tilde{\gamma}=1/\gamma_{\rm d}+1/\gamma_{\rm c}$  , i.e.,

$$\tilde{\kappa} \triangleq \lambda/\tilde{\gamma} \text{ and } \tilde{\zeta}_t \triangleq \mathbb{E}\left[\int_t^T \zeta_u \frac{\cosh((T-u)/\sqrt{\tilde{\kappa}})}{\sqrt{\tilde{\kappa}}\sinh((T-t)/\sqrt{\tilde{\kappa}})} \, du \middle| \mathscr{F}_t 
ight].$$

This balances the clients' demand for immediacy with their tolerance for risk, taking into account also their dealers' risk tolerance and ability of risk transfer to end-users:  $\tilde{U}^{\zeta} = U^{\mathscr{K}^*}$ .

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#### When do the clients really need their dealers?

#### Example: Constant target position



**Figure:** Risk vs. expected costs for clients' targeting a constant position. Trading through their dealers' and Searching end-users themselves. Peter Bank (TU Berlin)

#### When do the clients really need their dealers?

#### Example: Diffusively fluctuating target position



**Figure:** Risk vs. expected costs for clients' targeting a constant position. Trading through their dealers' and Searching end-users themselves.

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This is still **concave** in  $\mathscr{K}$  since  $\mathscr{K} \mapsto -\mathbb{E}\left[\int_0^T \mathscr{K}_t dS_t^{\mathscr{K}}\right]$  is the dealers' expected profit in equilibrium and thus nonnegative.  $\rightsquigarrow$  **no statistical arbitrage** in this model with **endogenously derived market impact**.

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Remarkably, first order condition for optimality now reads

$$\mathscr{K}_{t}^{*} = \frac{\gamma_{d}}{\gamma_{d} + \gamma_{c}/2} U_{t}^{\mathscr{K}^{*}} + \frac{\gamma_{c}/2}{\gamma_{d} + \gamma_{c}/2} \zeta_{t}, \quad t \in [0, T],$$

i.e. the **same equilibrium demand equation** as before, albeit with **half** the clients' risk aversion. Peter Bank (TU Berlin)

#### Conclusions

- analyzed dealer market with clients and end-users
- quadratic setting allows for explicit computations following
   Soner et al.'s optimal tracking results
- equilibrium quotes for arbitrary demand take into account legacy position and expected future positions
- optimization of demand with and without impact awareness
- dealers will be used if their search costs and risk aversion is small compared to those of their clients
- harder to serve sophisticated clients aware of their impact
- endogenously derived impact model ruling out statistical arbitrage
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## Happy (60 – $\varepsilon^{1/8.3125}$ )th birthday, METE!

Peter Bank (TU Berlin)